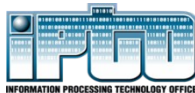


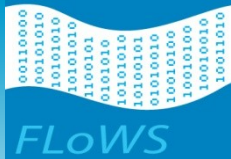
# Progress on General Capacity Using Network Coding

Muriel Médard

Joint with Jay Kumar Sudararajan, MinJi Kim, Devavrat Shah, Ralf Koetter



# Progress on General Capacity Using Network Coding



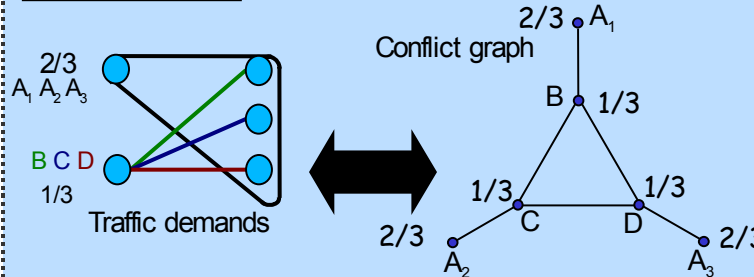
Status quo

- When separation holds, what is the benefit of having network coding?
- Major difficulty I: in non-multicast settings, codes are an open problem
- Major difficulty II: time-varying nature of traffic and of network operation, e.g. changing codes
- Major difficulty III: even without coding, performance is ill understood
- State of the art I: pick a system (say COPE) and run experimental trials to demonstrate improvement
- State of the art II: pick a multicast example and work it out by hand

**Achievement:** for networks of depth one (like switch)

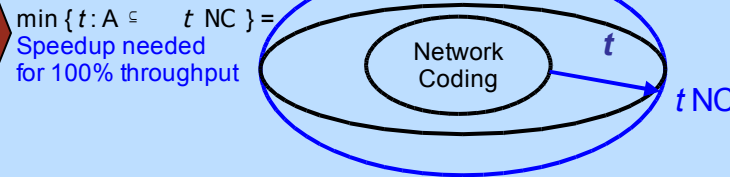
Provide a systematic way of characterizing achievable region and benefit of coding

**How it works:**



An edge between two vertices if the two configurations cause conflict

(i.e. They cannot be served simultaneously)



Can bound speed-up using imperfection ratio of conflict graph

**Assumptions and limitations:**

- Approach is general, but speedup characterized for depth one
- Works in separable settings
- Algorithms are centralized

End-of-phase goal

- To obtain general results for networks with multiple layers
- To incorporate MAC constraints into the conflict graphs, allowing mixture of MAC and scheduling
- To provide a set of systematic approaches to determine schedules
- Create online schemes, in the flavor of i-slip, to trade-off complexity and effectiveness of schedules, with possible decentralization

New insight/intellectual tool



Fixing family of possible codes, give systematic representation of achievable region using conflict graph representation

- Obviates the need for finding clever schedules by hand
- Difficulty of problem now becomes one of characteristics of conflict graph (for instance, perfection)— it is a combinatorial, graph-theoretic question
- Finding schedules now comes from conflict graph

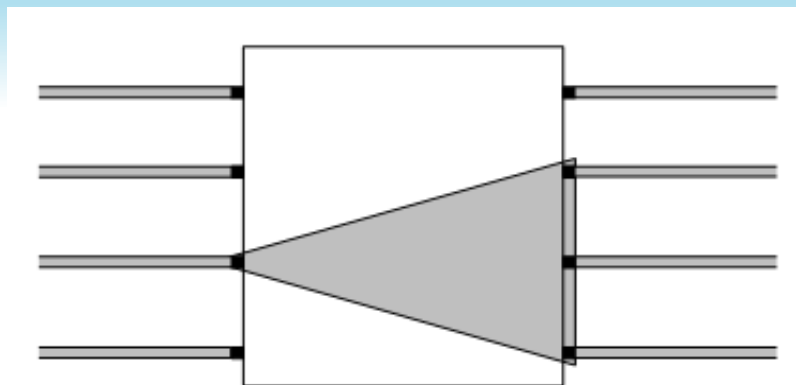
Community challenge

- How can we approximate difficult capacity region problems?
- How can we create schedules from such approximations?
- What is the loss that comes from a distributed scheduling?

**Ramification: bring problem to its combinatorial essence, which determines difficulty**

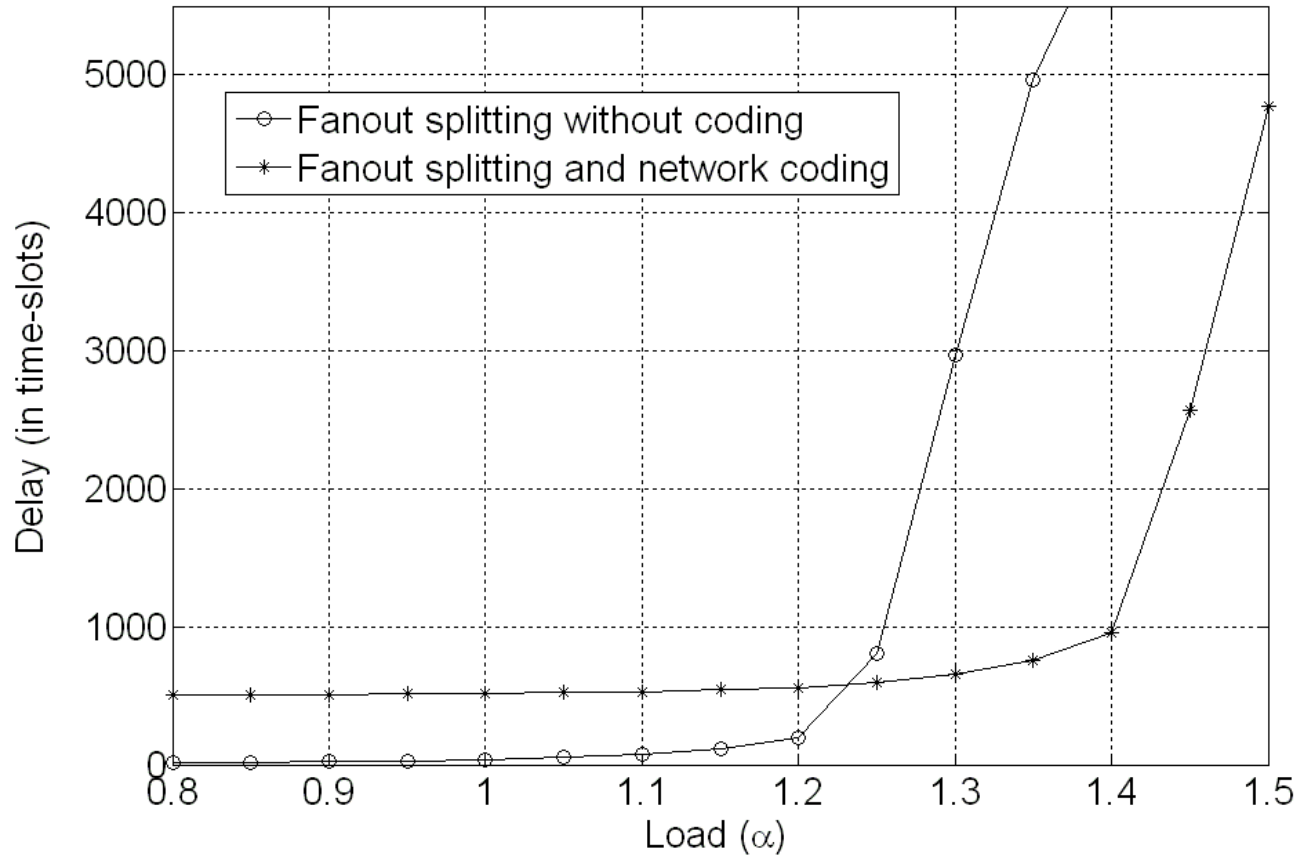
- When separation holds, what is the benefit of having network coding?
- In non-multicast settings, codes are an open problem
- Time-varying nature of traffic and of network operation, e.g. changing codes
- Even without coding, performance is ill understood
- State of the art:
  - Pick a system (say COPE) and run experimental trials to demonstrate improvement
  - Pick a multicast example and work it out by hand

- Transform scheduling problem into a combinatorial graph-theoretic question
- Fix family of possible codes; give systematic representation of achievable region using conflict graphs
- Obviates the need for finding clever schedules by hand
- Difficulty of problem now depends on the characteristics of conflict graph (for instance, perfection)
- Finding schedules now comes from conflict graph



- Focus on networks of depth one (eg. multicast switch)
- Provide a systematic way of characterizing the achievable rate region and the benefit of coding – using a simple and intuitive graph theoretic formulation
- Scheduling algorithms using rate decomposition approach

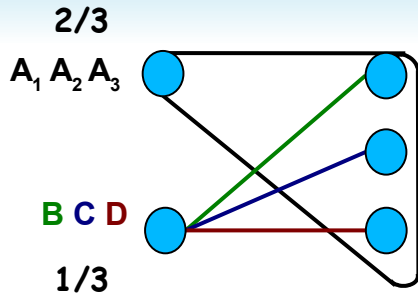
# Simulation Result



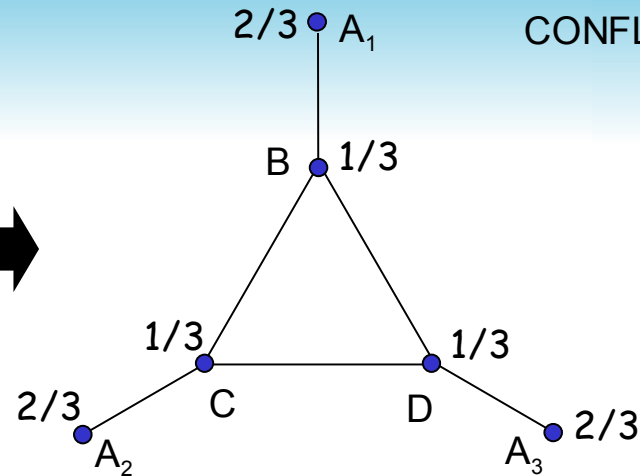
- 4 x 3 switch
- Traffic: mix of unicast and special pattern
- Used randomized variant of max weight scheduling

# How it works

## TRAFFIC DEMANDS



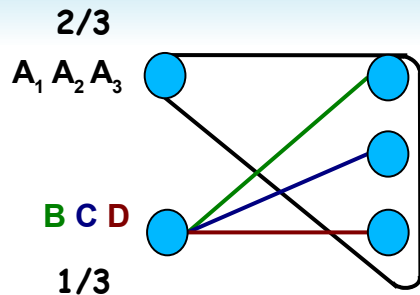
## CONFLICT GRAPH



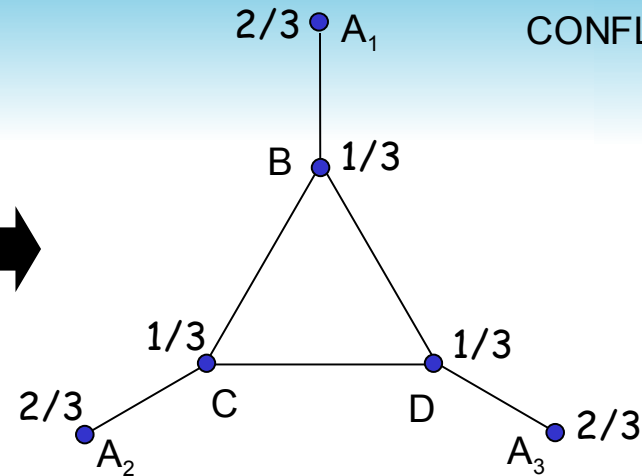
- Conflict graph:
  - A vertex for every network state (*i.e.* switch configuration)
  - An edge between two vertices if the two states cause conflict (*i.e.* two flows that cannot be served simultaneously)
- Map valid service configurations of the system of queues to stable sets of conflict graph

# How it works

TRAFFIC DEMANDS



CONFLICT GRAPH



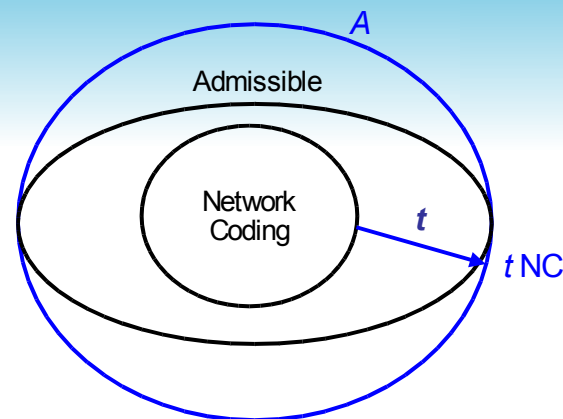
- Achievable rate region is the stable set polytope of the conflict graph
  - Closed form characterization known for several, but not all, classes of graphs
- Computing schedules based on rate decomposition – maps to weighted coloring of the graph
  - Polynomial time algorithm if the graph is perfect



# How it works

Speedup needed for  
100% throughput

$$= \min\{t \mid \mathbf{A} \subseteq t \cdot \mathbf{NC}\}$$



- Admissible region:
  - Set of rates such that no input or output node is overloaded
  - Corresponds to the clique inequality polytope of conflict graph
- Can use switch speedup to “expand” the rate region
- Speedup needed for 100% throughput = Factor of expansion for network coding region to cover admissible region
- **Result:** Imperfection ratio of conflict graph is an upper bound on the speedup needed for 100% throughput

# Assumptions and limitations

- Approach is general, but the speedup results are only for a network of depth one
- Works in settings where separation holds
- The algorithms are centralized. This could be a limitation some scenarios

# End of phase goals

- To obtain general results for networks with multiple layers
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# Conclusions and Discussion

- New systematic approach to scheduling and rate region questions in network coding
- Transforms problem into a combinatorial graph theoretic formulation
- Incorporates time sharing among different connection states and codes – scheduling using graph coloring

# Summary: Progress on General Capacity Using Network Coding



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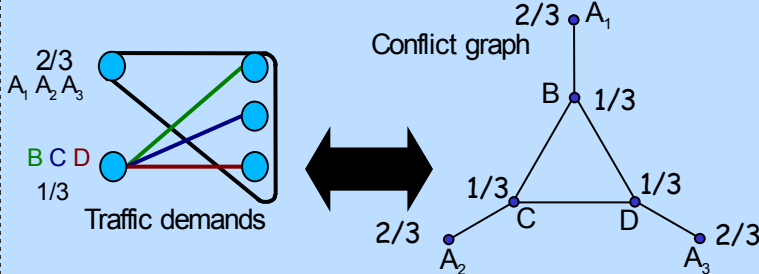
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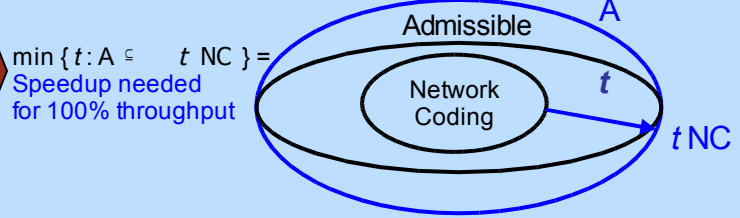
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